

## Problem set 2

*December 8, 2015*

Due: Nov 24

- Please submit the handout in class, or email the grader (omer.rotem1 at gmail.com ).
- Write clearly and shortly using sub-claims if needed. The emphasize in most questions is on the proofs (no much point is writing a “solution” w/o proving its correctness)
- For Latex users, a solution example can be found in the course web site.
- It is allowed to work in (small) groups, but please write the id list of your partners in the solution file, and each student should write his solution by *himself* (joint effort is only allowed in the “thinking phase”)

1. Prove the chain rule from mutual information (see, Lecture 2, Slide 21)
2. For random variables  $X$  and  $Y$ , what is larger  $I(X; Y|Z)$  or  $I(X; Y)$ ?
3. Let  $X \rightarrow Y \rightarrow Z$  be a Markov chain. Is it always the case that  $I(Y; Z) \geq I(X; Z)$ ?
4. Formally define and prove the infinite case of Kraft inequality (Thm. 2, Lecture 4).
5. Let  $X \sim (p_1, \dots, p_m)$  such that each  $p_i$  is a power of 2 (i.e.,  $2^{-k}$  for some  $k \in \mathbb{Z}$ ).
  - (a) (This part did not appear in the version I asked you to solve, but it is needed for solving Q6).  
 Prove that Huffman's code assigns a word  $x \in \text{Supp}(X)$  of probability  $2^{-i}$ , a codeword of length  $i$ .
  - (b) Prove that the average code length obtained by Huffman's code for  $X$  is (exactly)  $H(X)$ .
6. Use the above question and the optimality of Huffman's code to deduce that the average code length obtained by Huffman's code on any random variable  $X$  is at most  $H(X) + 1$ . (Do that without using the upper bound on the optimal code length proved in class).  
 Can you prove it without the assumption that the binary expansion of each  $p_i$  is finite?
7. Prove Proposition 5 in Lecture 4.